

# Energy efficiency in industry

## Analysing the potential by using an agent-based simulation

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# Outline

## 1. Research Topic

## 2. Material and Methods

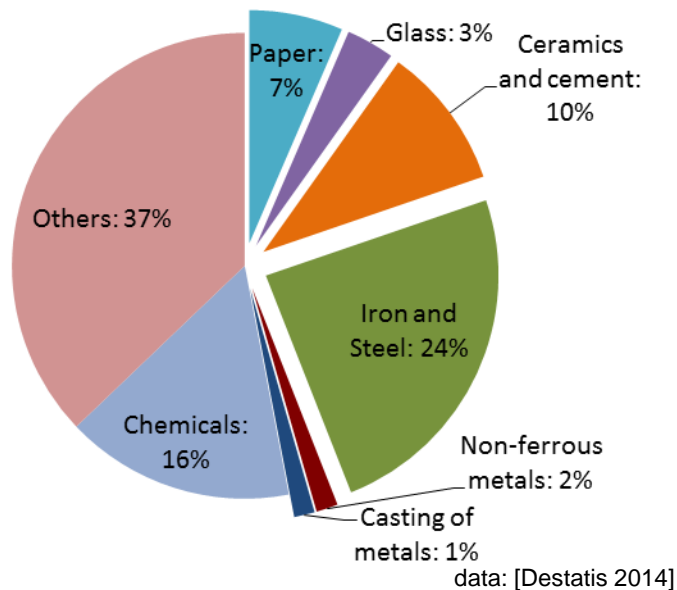
1. General approach
2. Expert interviews, company survey and cluster analysis
3. Agent-based simulation

## 3. Discussion and Outlook



# 1.1 Energy use and greenhouse gas emissions

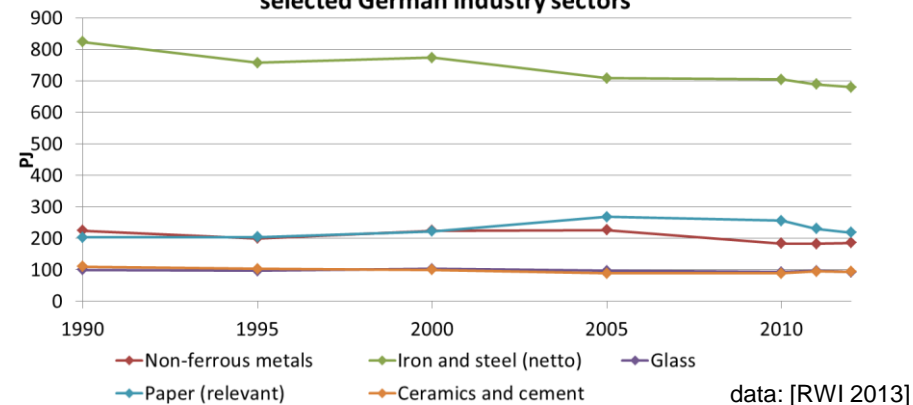
Emission relevant energy use in German industry 2012



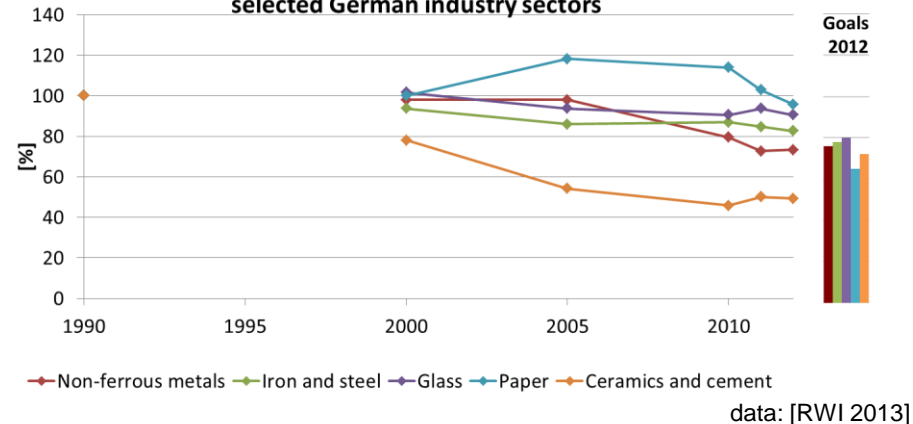
## Criteria for choice of sectors:

- Rather homogenous products
- Specific energy use
- Size of sector (employees, gross value added, revenues, ...)

Total energy use in selected German industry sectors



Development of specific carbon dioxide emissions in selected German industry sectors



## Future goals Germany (not industry specific):

- GHG: 2020: -20%, 2050: -80% (vs. 1990)
  - Primary energy use: 2020: -20%, 2050: -50% (vs. 2008)
- [BMWi & BMU 2011]

## 1.2 Studies on energy efficiency potentials

Article/thesis	# Sector		Focal point			Method							Sector insights
	One sector	More than one sector	Diffusion of energy efficiency technologies	Analysing historical development	Potential of energy efficiency and future carbon dioxide emissions	Bottom-Up				Top-Down		Hybrid approach	Sophisticated differentiation of companies
						Optimization	System Dynamics	Simulation	Others	General equilibrium models	Input Output		
[Arens & Worrel 2014]	X		X						X				
[Böhringer et al. 2002]		X		X						X			
[Breun et al. 2014]		X			X	X					X	X	
[Brunke & Blesl 2014a , b]	X		X		X							X	
[Fleiter et al., 2013]		X			X				X				
[Ilsen, 2011]		X			X			X			X	X	
[Pardo & Moya, 2013]	X				X			X					
[Schaffer 2002]		X									X		
[Schneider et al. 2014]		X			X				X				
[Seitz 2015]	X		X				X						X

## 1.3 Objective of research project

- The studies do not (or only to a small extent) differentiate between company types or pay attention to human behaviour
  - What are behavioural and decision aspects when analysing investments in energy efficient technologies?
- Analysing barriers and drivers and interdependencies for investments in energy efficiency
- Is an agent-based simulation a suitable tool for doing so?

# Outline

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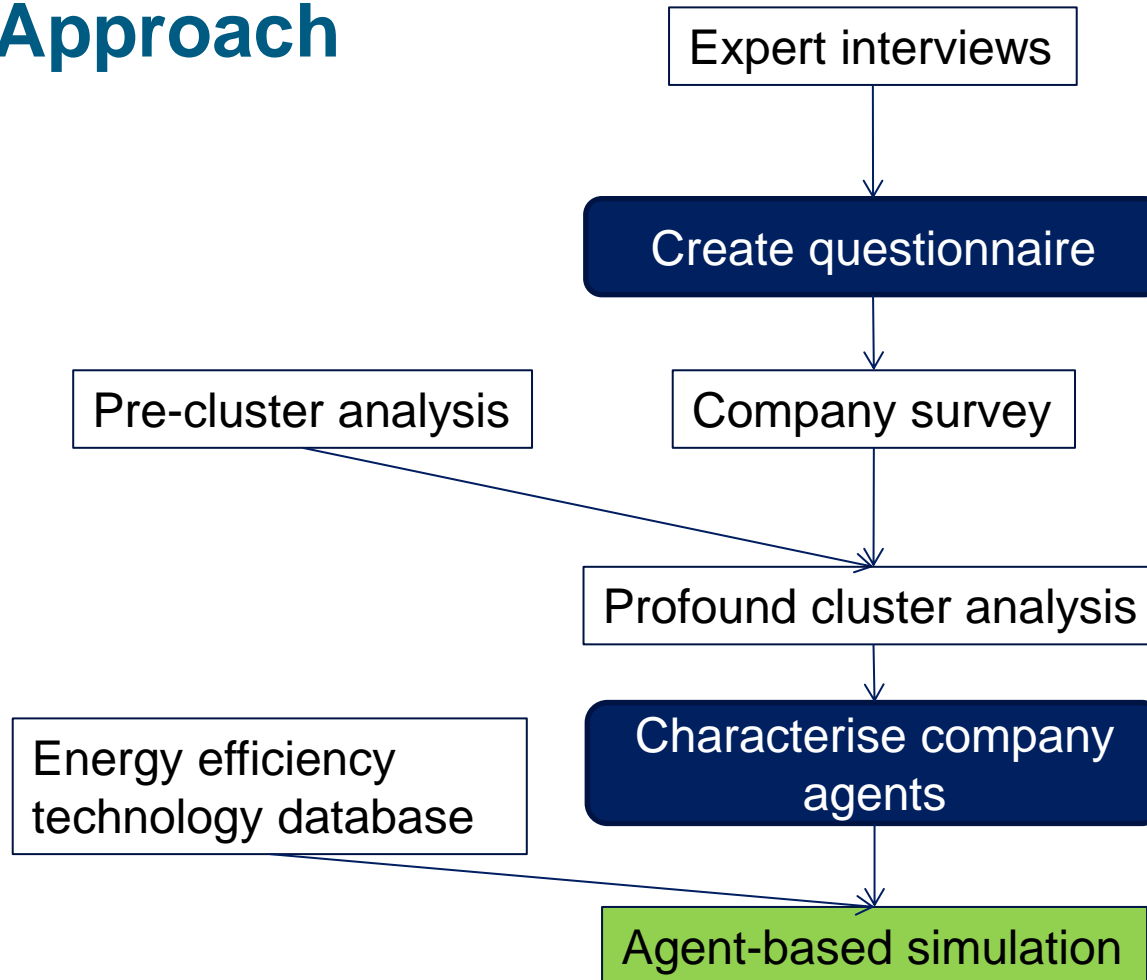
## 2. Material and Methods

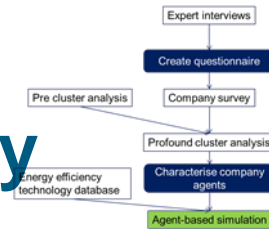
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## 2.1 Approach





## 2.2 Expert interviews and company survey

Analysed Sectors according to WZ 2008 [Destatis 2015]:

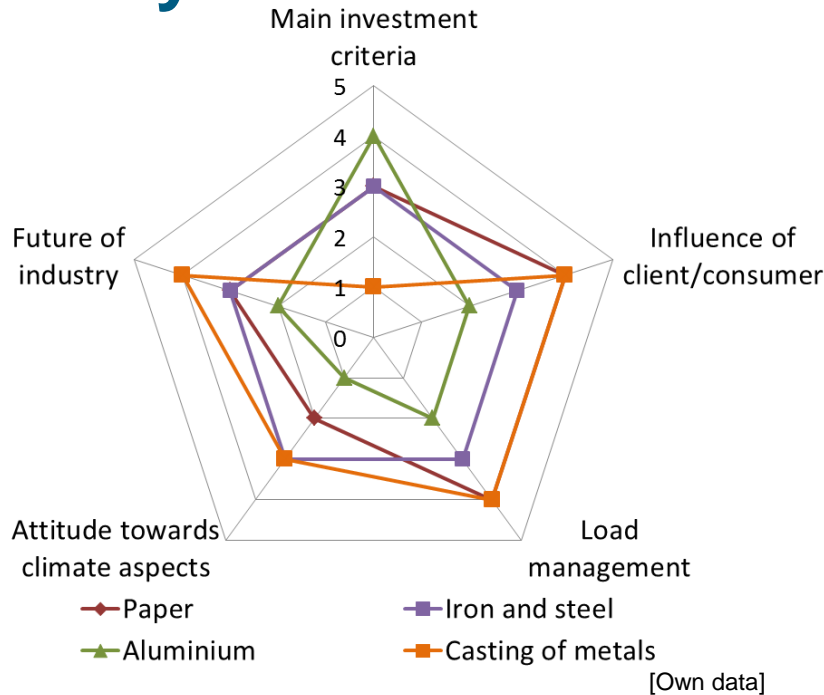
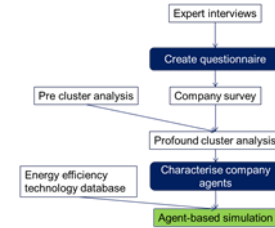
- Manufacture of pulp, paper and paperboard
  - 189 companies (> 9 employees)
- Manufacture of glass and glass products
  - 216 companies (> 9 employees)
- Manufacture of cement
  - 28 companies (> 9 employees)
- Manufacture of basic iron and steel
  - 177 companies (> 9 employees)
- Aluminium production
  - 116 companies (> 9 employees)
- Casting of metals
  - 485 companies (> 9 employees)

1. Interviews with one representative of industry associations and one representative of a company in each analysed sector → 12 interviews.
2. Survey with approx. 200 companies out of 1,211.

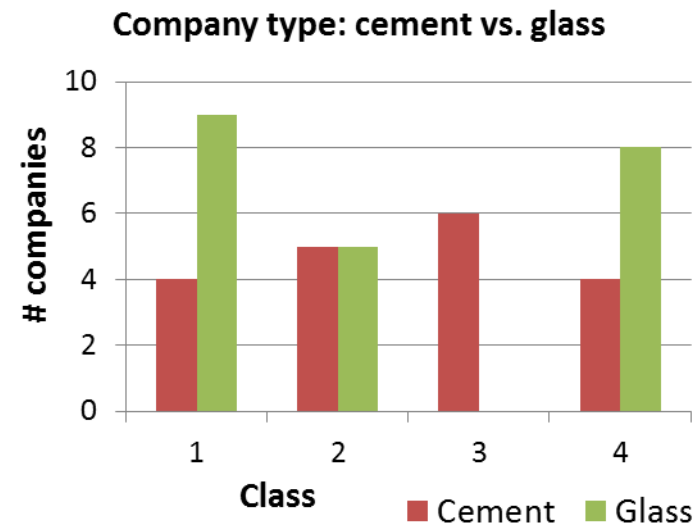
**Topics:** energy efficiency technologies, investment parameters, energy policy, future expectations



## 2.2 Expert interviews and pre-cluster analysis

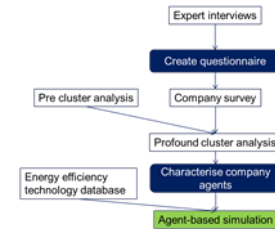


- **Source:** annual financial statements, company information (homepage,...)
- **Parameters:** company type, #facilities, own electricity generation, products, #employees, revenue, fixed capital, environmental affinity
- **Method:** distance and similarity measures



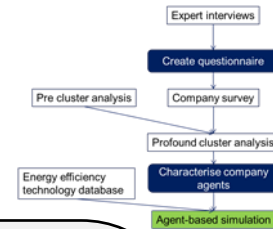
- 1: Part of international group, head office abroad  
 2: Part of international group, head office in Germany  
 3: German group, only German sites  
 4: Single company with one site

data: [Bundesanzeiger 2015]

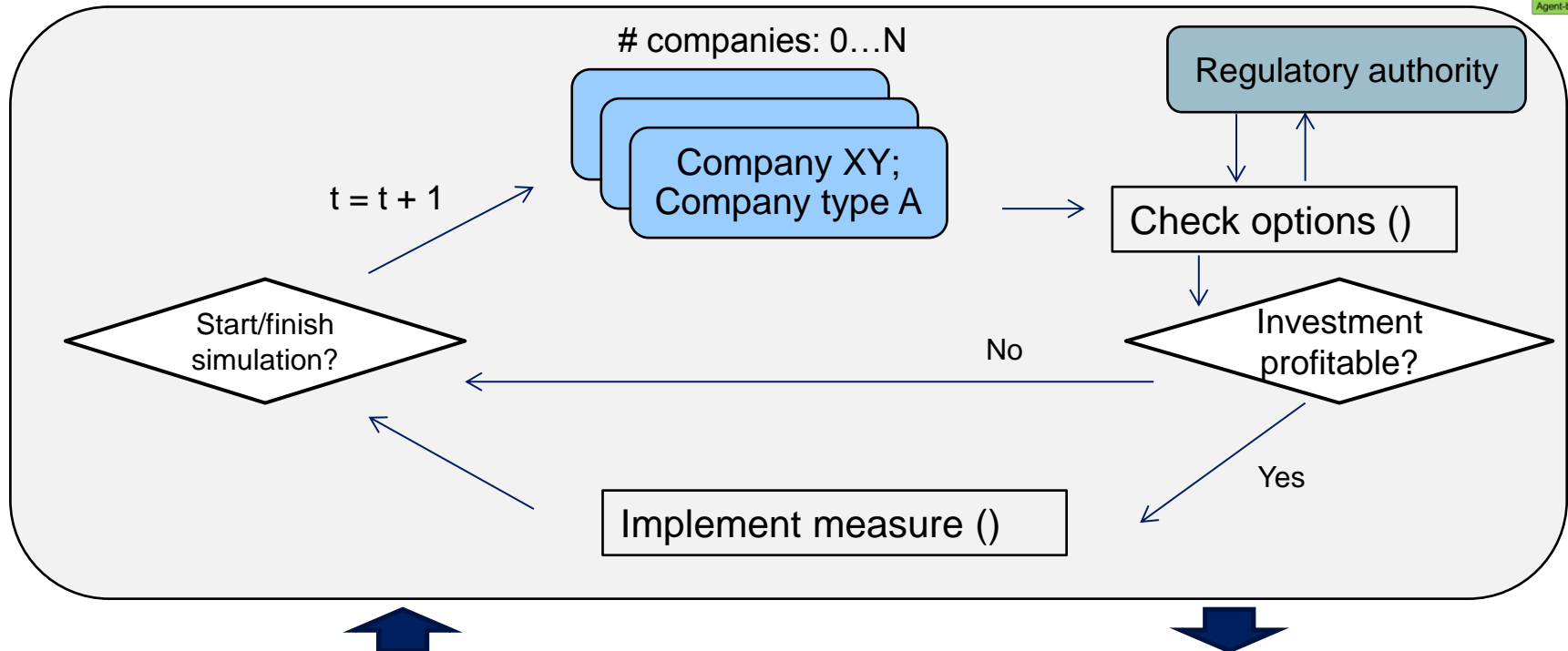


## 2.3 Agent-based simulation (ABS)

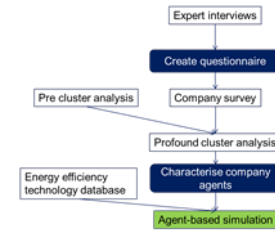
- **Explanation:**
  - Simulation to explain and understand complex systems
  - Each agent interacts with its environment (Agent is a representation of a distributed and autonomous entity)
  - The sum of the actions of each single agent determines the system behaviour
- **Advantages:**
  - Different entities (companies, regulatory authority, distributor of technologies,...) can be represented
  - Agents can be modelled with different character and behaviour
  - Agent can adapt its behaviour (learning effect, interaction)
- **Disadvantages:**
  - High effort for calibration and validation
  - No sufficing possibility for induction → Which agent is responsible for system behaviour?



## 2.3 ABS – basic model



**Database (different often inhomogeneous and ill-matched data):**  
**Company details:** size, costs, age of facilities, ...  
**Energy efficiency measures:** performance, price, ...  
**Economic development:** prices of commodities, development of production, ...  
**Political instruments:** taxes, emission trading, penalties, guidelines, ...  
 ...



## 2.3 ABS – basic model

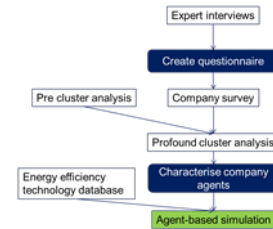
### Indirect interaction of agents (not yet implemented):

- Characteristics of efficiency measures can change according to the number of companies implementing this measure
- Share of production for companies can change according to behaviour of other companies
- Interaction with regulatory authority that can change the rules of the game

### Methods:

- Check options ():
  - Evaluation of different possible measures by using the set investment calculation methods
  - Choice of measure that fulfils the conditions the best
- Implement measure ():
  - Update characteristics of facility (remove data of old machine/measure and adjust data for energy use, emissions, productivity,...)
  - Update production costs of facility

## 2.3 ABS – evaluation of efficiency measures:



### 1. Check age of machine/facility

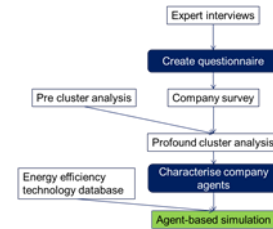
- For each company {
  - For each facility/machine {
    - If AgeOfFacility/machine == 1 {
      - then checkRestrictionsOfMeasures () }}}

### 2. Check type of machine/facility

- Company X: For each measure {
  - requirements ok ();
  - conflicts ok ();

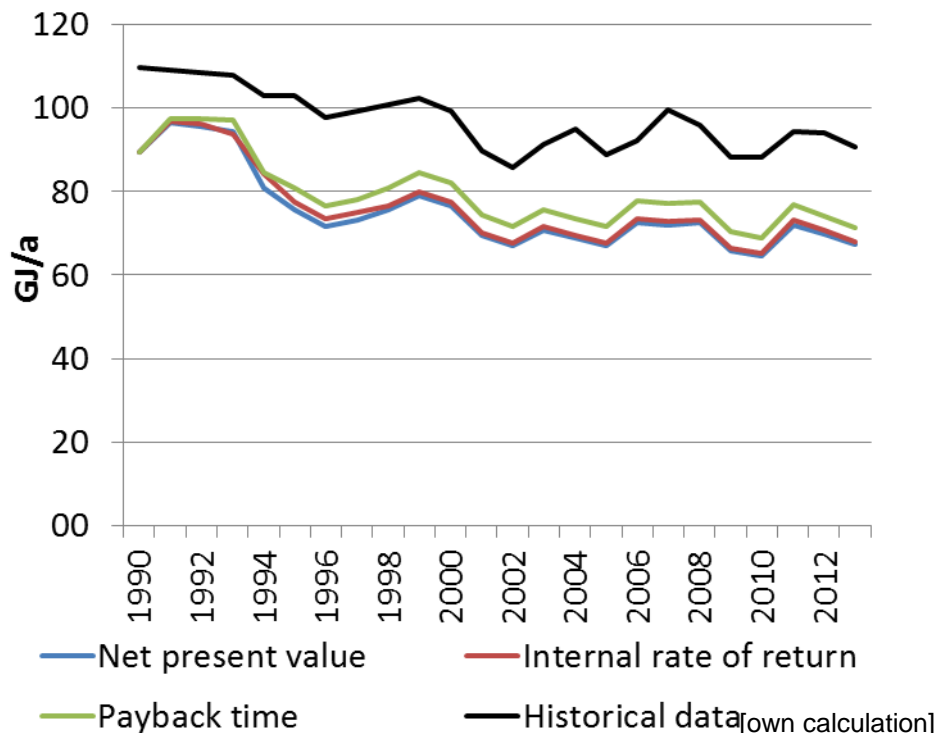
### 3. Calculate the net present value of possible measures and chose the measure with the highest value

- Company X and measures type Y:
  - Chose max (NPV Y<sub>1</sub>, NPV Y<sub>2</sub>, ..., NPV Y<sub>n</sub>)
  - NPV:  $C_0(i) = \sum_{t=0}^T \frac{Z_t}{(1+i)^t}$ , C<sub>0</sub>: net present value at time t=0, i: interest rate, T: periods, Z<sub>t</sub>: Cash flow in period t



## 2.3 ABS – first results (calibration)

Simulated thermal energy use in cement sector 1990-2013



- No consideration of financing aspects
- Deterministic development of production and prices
- All companies use the same calculation method for investment decisions
- Constant supply of measures with constant characteristics (performance, price)
- **Thermal energy use, electricity use and carbon dioxide emissions** are examined

Interest 15%, different investment calculation rules for replacement investments, payback time is used for additional investments (within the life cycle of machine)

# Structure

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## 3 Discussion

- Will the outcome of the company survey be sufficient to identify different company types and strategies to implement different investment behaviour?
- Will the data about energy efficiency measures be adequately detailed (performance, price, complexity)?
- Are the most important parameters and barriers identified for the purpose of the study?
- Is agent-based simulation a suitable method for this subject?



## 3 Outlook

- run different scenarios up to 2050

# Thank you very much for your attention!

# References

- [Arens & Worrell, 2014] ARENS, M. & WORRELL, E. (2014) Diffusion of energy efficient technologies in the German steel industry and their impact on energy consumption. *Energy*, 73:0, 968-977.
- [BMW & BMU 2011] BMWI & BMU (2011) *Energiekonzept für eine umweltschonende, zuverlässige und bezahlbare Energieversorgung*. Berlin.
- [Böhringer et al., 2002] BÖHRINGER, C., LÖSCHEL, A. & ROHDE, A. (2002) PACE - Policy analysis based on computable equilibrium. *Forum für Energiemodelle und Energiewirtschaftliche Systemanalysen in Deutschland: Energiemodelle zum Kernenergieausstieg in Deutschland - Effekte und Wirkungen eines Verzichts auf Strom aus Kernkraftwerken*. 119-142, Heidelberg, Physica-Verlag.
- [Breun et al., 2014] BREUN, P., FRÖHLING, M. & SCHULTMANN, F. (2013) A hybrid model to evaluate climate policies with regard to resource intensive industries. *Joint 11th socio-economic Metabolism Conference and 4th ISIE Asia-Pacific Conference*, November 17-19, 2014, Melbourne, Australia
- [Brunke & Blesl, 2014a] BRUNKE, J.-C. & BLESL, M. (2014a) Energy conservation measures for the German cement industry and their ability to compensate for rising energy-related production costs. *Journal of Cleaner Production*, 82:0, 94-111.
- [Brunke & Blesl 2014b] BRUNKE, J.-C. & BLESL, M. (2014b) A plant-specific bottom-up approach for assessing the cost-effective energy conservation potential and its ability to compensate rising energy-related costs in the German iron and steel industry. *Energy Policy*: 67:0, 431-446.
- [Bundesanzeiger 2015] BUNDESANZEIGER (2015a) *Jahresabschlüsse zum Geschäftsjahr 2013, Rechnungslegung/Finanzberichte*. Berlin, Bundesanzeiger Verlag, [www.bundesanzeiger.de](http://www.bundesanzeiger.de) (last access: 10/06/2015).
- [Destatis 2014] DESTATIS (2014) *Tabellen zu den Umweltökonomischen Gesamtrechnungen, Teil 2: Vorbericht Energie, Berichtszeitraum 1995 - 2013*. Statistisches Bundesamt, Wiesbaden.
- [Destatis 2015] DESTATIS (2015) *Statistisches Unternehmensregister – Unternehmen nach Wirtschaftsgruppen und Größenklassen der sozialversicherungspflichtig Beschäftigten im Berichtsjahr 2012*, Registerstand: 30.05.2014, Statistisches Bundesamt, Wiesbaden.
- [Fleiter et al. 2013] FLEITER, T., SCHLOMANN, B. & EICHHAMMER, W. (2013) *Energieverbrauch und CO2-Emissionen industrieller Prozesstechnologien - Einsparpotenziale, Hemmnisse und Instrumente*. Karlsruhe, Fraunhofer Verlag.
- [Ilsen, 2011] ILSSEN, R. (2011) *Ein Beitrag zur modellgestützten Analyse umweltpolitischer Instrumente in den Bereichen Luftreinhaltung und Klimawandel*. Deutsch Französisches Institut für Umweltforschung (DFIU), Karlsruhe, KIT.
- [Pardo & Moya, 2013] PARDO, N. & MOYA, J. A. (2013) Prospective scenarios on energy efficiency and CO2 emissions in the European Iron & Steel industry. *Energy*, 54:0, 113-128.
- [RWI 2013] FRONDEL, M., JANßEN-TIMMEN, R. & RITTER, N. (2013) *Die Klimavorsorgeverpflichtung der deutschen Wirtschaft – Monitoringbericht 2011 und 2012*. Rheinisch-Westfälisches Institut für Wirtschaftsforschung (rwi), Essen.
- [Schaffer, 2002] SCHAFFER, A. (2002) *Ecological input-output analysis : ECOLIO - a model for conventional and ecological key sector analyses in Germany*. Wirtschaftswissenschaften, Karlsruhe, Universität Karlsruhe.
- [Schneider et al., 2014] SCHNEIDER, C., LECHTENBÖHMER, S. & S., H. (2014) *Re-industrialisation and low carbon economy – can they go together? Results from transdisciplinary scenarios for energy intensive industries*. ECEEE 2014 INDUSTRIAL SUMMER STUDY – RETOOL FOR A COMPETITIVE AND SUSTAINABLE INDUSTRY, Arnhem.
- [Seitz, 2015] SEITZ, C. (2015) *Diffusion innovativer Antriebstechnologien zur CO2-Reduktion von Nutzfahrzeugen – Empirische Untersuchung des organisationalen Adoptionsverhaltens und systemdynamische Prognose für den deutschen Automobilmarkt*. Fakultät für Wirtschaftswissenschaften, Karlsruhe, Karlsruher Institut für Technologie.